

## ABSTRACT

- Approximate computing can address a lot of challenges in exascale computing.
- We studied approximate approaches to solving a range of Department of Energy (DOE) relevant computational problems on a variety of architectures.
- Anticipated **improvements** are observed in **computational** and **memory performance** as well as in **power savings**.
- Application correctness** is determined to be **within acceptable bounds** while operating under the conditions of reduced precision.

## BACKGROUND

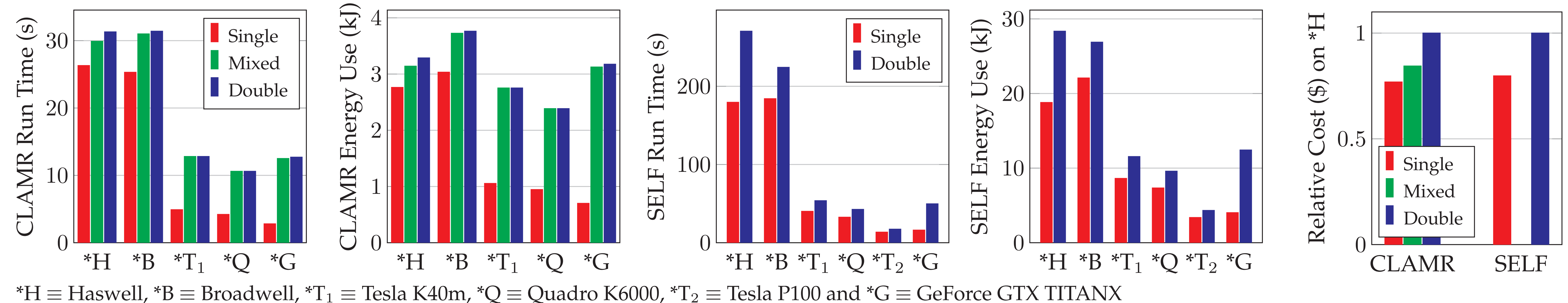
- Floating-point numbers can consist of 16-bits (half precision), 32-bits (single precision), 64-bits (double precision) etc.
- Mixed precision sets the large physical state arrays to single precision, but promotes all local calculations to double precision.
- Mixed-precision code can sometimes achieve **similar accuracy** to its double-precision counterpart while being **significantly faster and reducing memory pressure**.
- Instead of reducing precision everywhere, it is advisable to focus on **choosing the level of precision according to the needs of the calculation**, to the extent of increasing precision in well-chosen sub-calculations e.g. **global sums** and lowering it elsewhere.

## METHODOLOGY

We investigated the impacts of varying precision on **CLAMR**, a hydrodynamic cell-based adaptive mesh refinement DOE mini-app and another mini-app **SELF** (Spectral Element Libraries in Fortran) on different architectures viz.

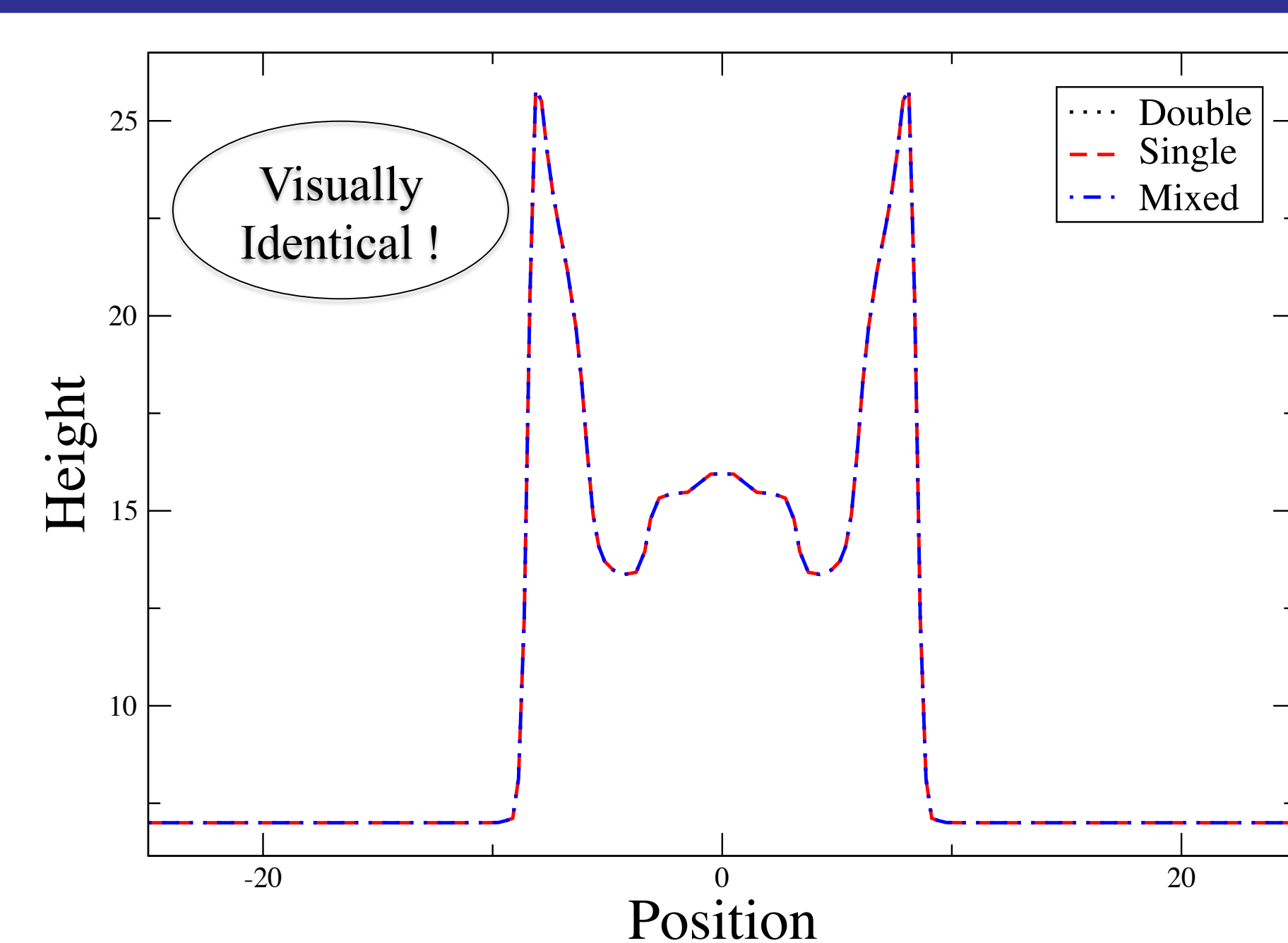
- Intel Xeon E5-2660\_v3 **Haswell (\*H)** CPU
- Intel Xeon E5-2695\_v4 **Broadwell (\*B)** CPU
- Nvidia **Tesla K40m (\*T<sub>1</sub>)** GPU
- Nvidia **Quadro K6000 (\*Q)** GPU
- Nvidia **Tesla P100 (\*T<sub>2</sub>)** GPU
- Nvidia **GeForce GTX TITANX (\*G)** GPU

## PRECISION COST ANALYSIS RESULTS

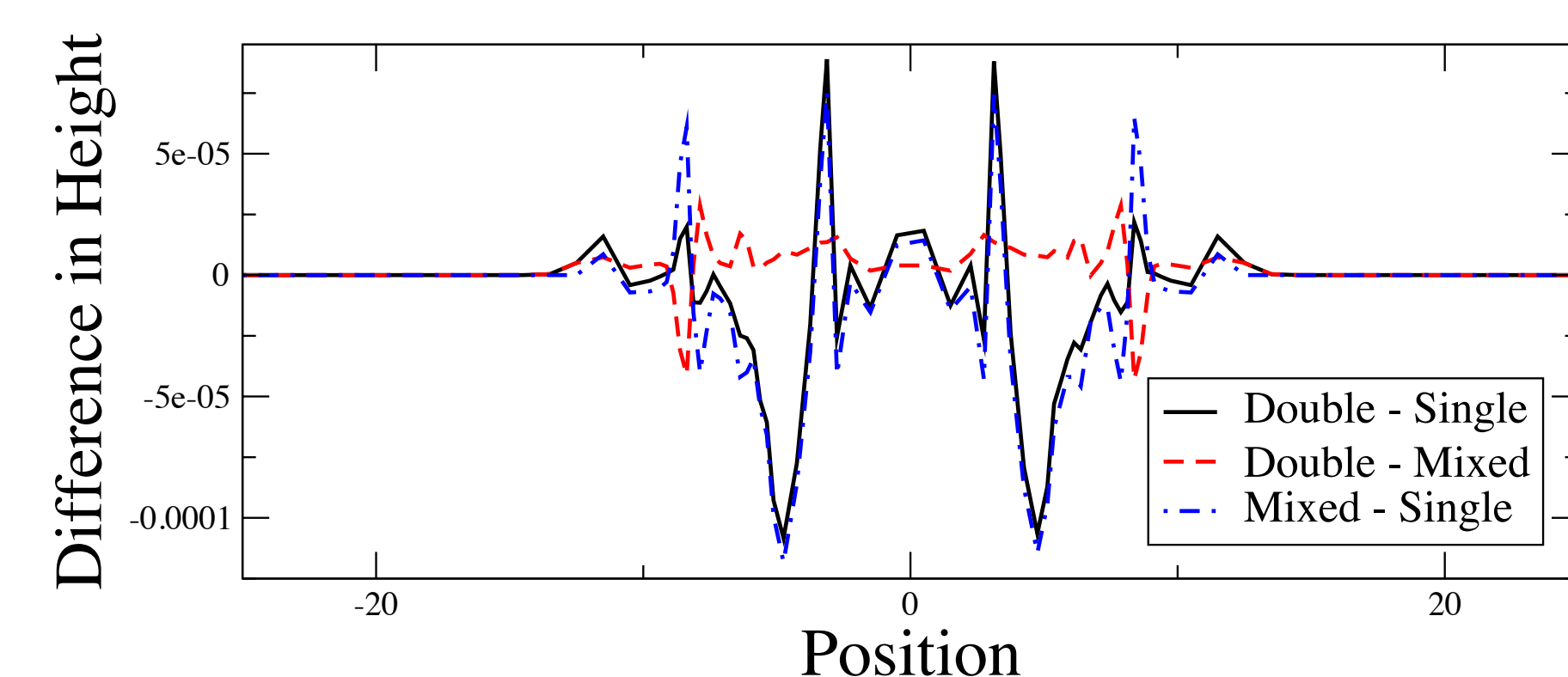


## ACCURACY ANALYSIS

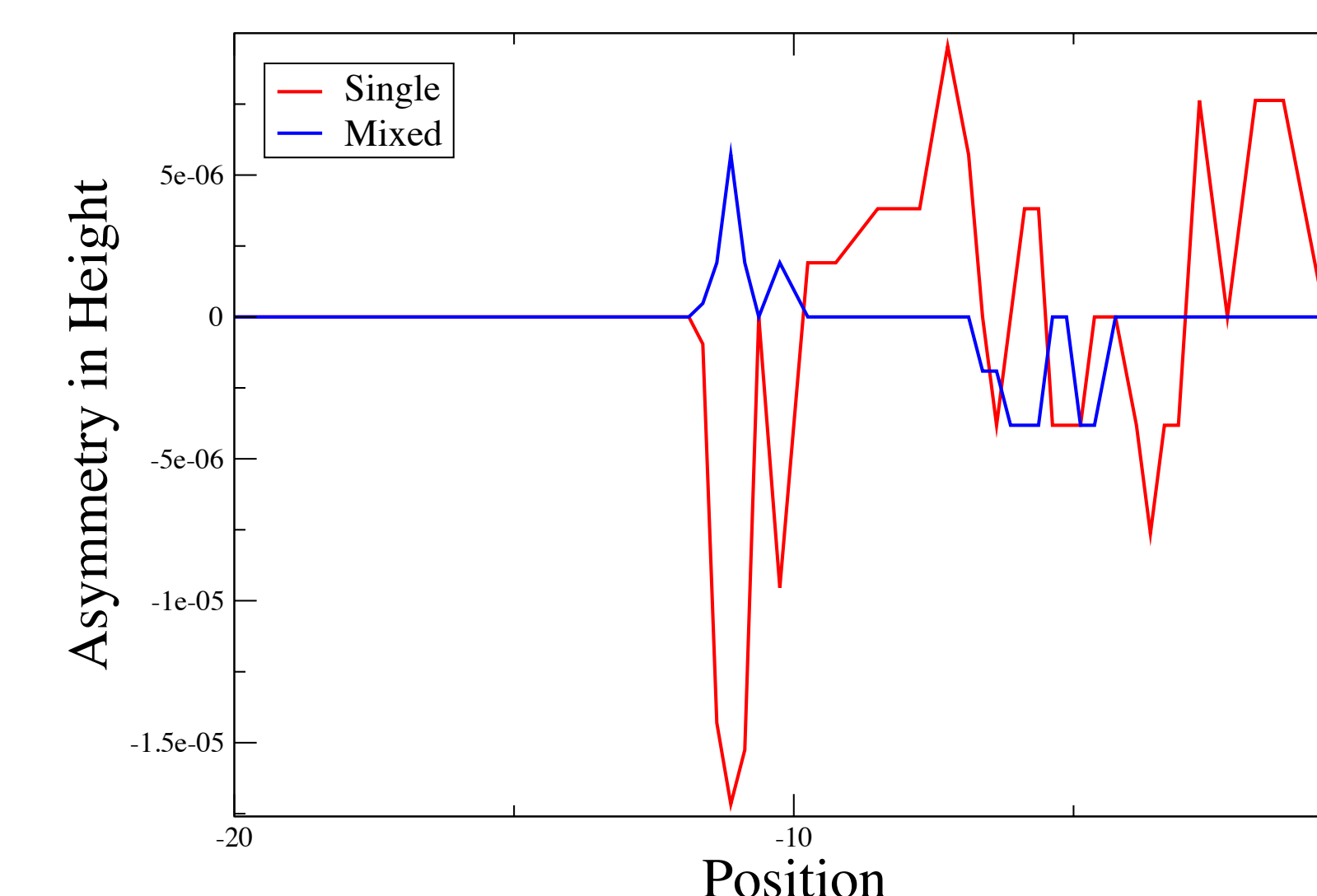
Slices of CLAMR simulation results with  $64 \times 64$  grid points, 2 AMR levels and varying precision



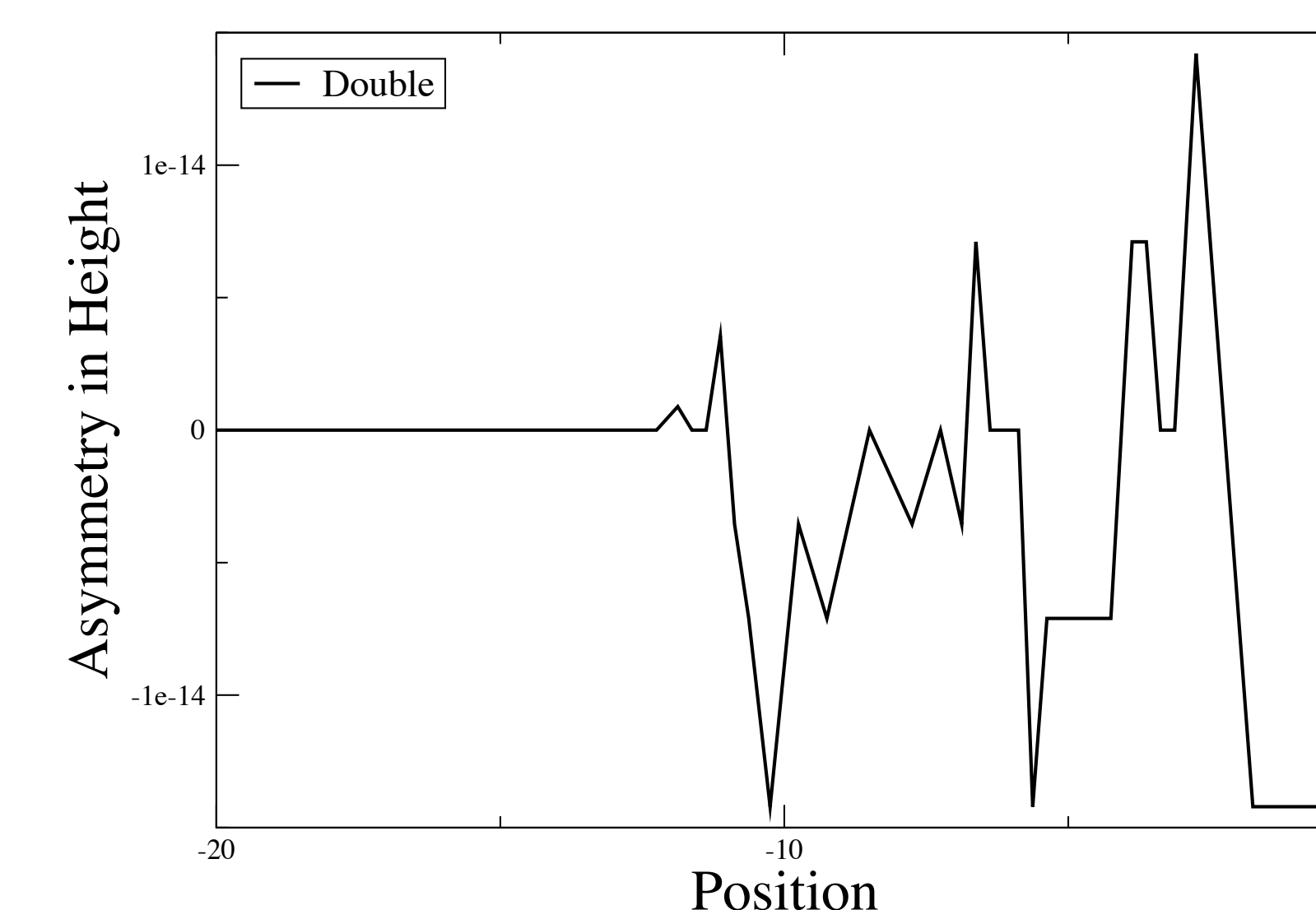
Differences among the CLAMR simulations



Height asymmetry for single & mixed precisions



Height asymmetry for double precision



## CONCLUSION

- We have demonstrated that in two different DOE-relevant mini-applications, **reduced precision can save**
  - computational time and cost**
  - storage cost**
  - memory use**
  - power consumption**
- and **increase performance** significantly with **modest changes** to the application code base.
- Careful implementation of precision** in well-chosen parts of the code can **preserve application correctness** to an appreciable degree.
- We can **complement lower precision** by **increasing the degrees of freedom**.
- Hardware choice is important** as reduced precision greatly improves the performance of **CLAMR** on the **GPUs** and **SELF** on the **Haswell CPU** and the **GTX TITANX GPU**.
- This provides us with a great opportunity for hardware-software **codesign**.

**It is time for application developers to jump on this disruptive trend in computing capabilities.**

## REFERENCES

- [1] Shane Fogerty, Siddhartha Bishnu, Yuliana Zamora, Laura Monroe, Steve Poole, Michael Lam, Joe Schoonover, and Robert Robey. Thoughtful Precision in Mini-apps. Technical report, Los Alamos National Laboratory, 2017. LA-UR-17-25426.

## ACKNOWLEDGEMENTS

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